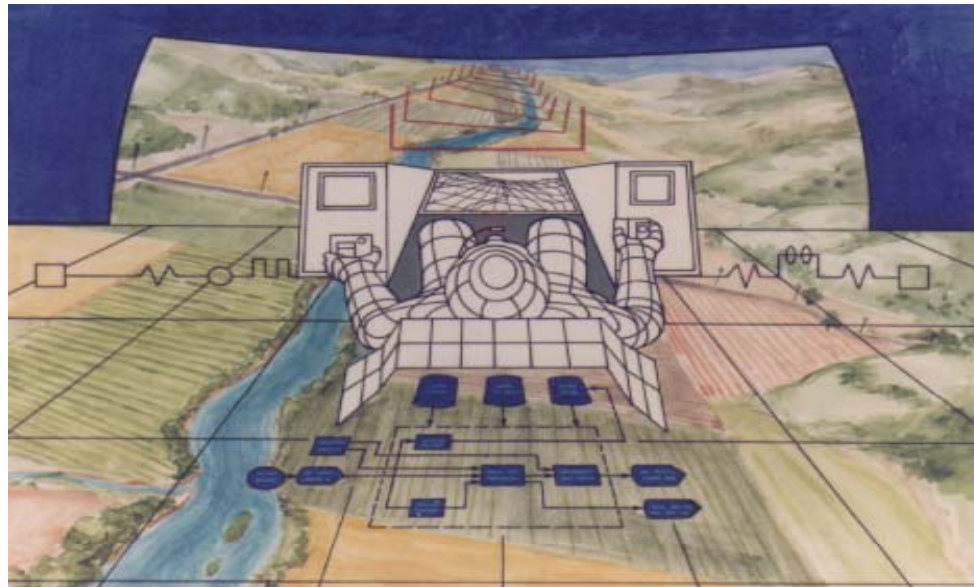




# System-Wide Accident Prevention: Human Performance Modeling



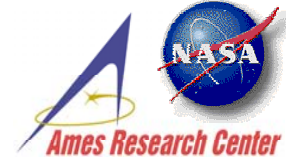
**David C. Foyle, Ph.D.**  
**Allen Goodman, M.A.**  
**NASA Ames Research Center**  
(650) 604-3053 [dfoyle@mail.arc.nasa.gov](mailto:dfoyle@mail.arc.nasa.gov)



# Outline of Topics

AvSP SWAP

Human Performance Modeling



- **Problem, Approach and Goal**
  - Errors and accidents in Aviation
  - Model development plan
- **Developing Cognitive Modeling Tools for System Design**
  - Overview of 5 modeling frameworks
  - Application to taxi-navigation problem
  - Application to approach and landing operations with and without augmented displays
- **Developing an Activity Tracking Model for Error Detection and Analysis**
  - Overview of CATS (Crew Activity Tracking System)
  - Application to flight test data



# Problem, Approach and Goal

## Problem

- Accident precursors are complex interaction of latent error in a system design or procedure (and dynamic interaction of design, human operation and environment)
- Difficult to observe rare error and error precursors in aviation environment ( $1 \times 10^{-n}$ )
- Design cycle (design, build, evaluate, field, revise) is difficult, expensive, and time-consuming

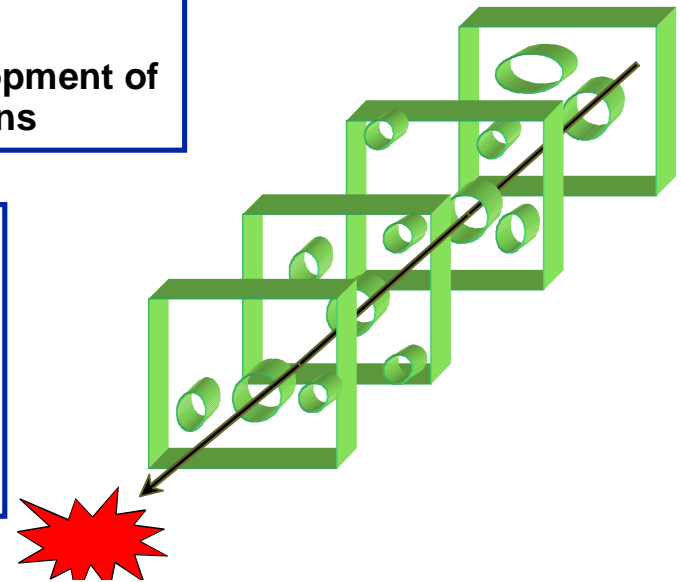
## Approach

- Identify scenarios with high probability of human error
- Identify/model precursors to errors
- Assess technological and procedural solutions via development of computational models of scenarios and candidate solutions

## Goal

Develop modeling capability to:

- Assess technological and procedural solutions via development of computational models of scenarios and candidate solutions
- Test potential mitigation strategies



Accidents/ Incidents  
Error/ Error precursors

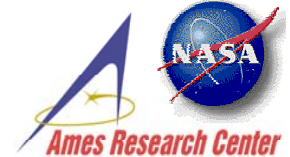
Reason 1990



AvSP SWAP

# Plan FY00-FY04

Human Performance Modeling



## Two Development Tracks

**Human  
Performance  
Modeling\***

Aviation  
Error  
Contexts

Review of  
Models

RFP Letter  
(formal review)

**Error Detection  
Modeling -  
Crew Activity  
Tracking System  
(CATS)**

Taxiway  
Errors

Approach /  
Landing  
w/ Aug.  
Displays

Multiple A/L  
Scenarios  
w/ Aug.  
Displays

Validation

Off-line  
Flight  
Data  
Analysis

Error  
Mechanism

Error  
Simulation  
with CATS  
Agents

\* Multiple models addressing same operational problem

*Plan Constraint: limited resources for supporting empirical work* □



# Selected Modeling Frameworks

## Characteristics of selected models

- Operator level, cognitively oriented
- Comprehensive, mature and validated systems
- Integrative frameworks facilitating fast-time simulation
- Output is generative, stochastic, context sensitive

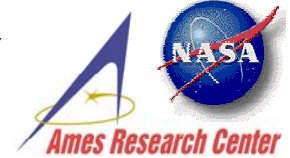
<i>Model</i>	<i>Type</i>	<i>Research Team</i>	<i>Demonstrated Sources of Pilot Error</i>
<b>ACT-R/PM</b>	Low-level Cognitive with Statistical Environment Representation	Mike Byrne Rice University Alex Kirlik University of Illinois	* Time pressure * Misplaced expectations * Memory retrieval problems
<b>Air MIDAS</b>	Integrative Multi-component Cognitive	Kevin Corker Brian Gore Eromi Guneratne Amit Jadhav & Savita Verma San Jose State University	* Workload * Memory Interference * Misperception
<b>A-SA</b>	Component Model of Attention & Situational Awareness	Chris Wickens Jason McCarley Lisa Thomas University of Illinois	* Misplaced attention * Lowered SA
<b>D-OMAR</b>	Integrative Multi-component Cognitive	Stephen Deutsch Richard Pew BBN Technologies	* Communications errors * Interruption & distraction * Misplaced expectation
<b>IMPRINT/ ACT-R</b>	Hybrid: Task Network with Low-level Cognitive	Rick Archer Micro Analysis and Design, Inc. Christian Lebiere, Dan Schunk, & Eric Biefeld Carnegie Mellon University	* Time pressure * Perceptual errors * Memory retrieval * Inadequate knowledge



# Progressive Implementation Strategy

AvSP SWAP

Human Performance Modeling

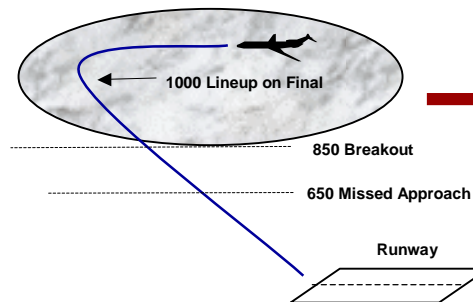


*Advancing cognitive models into increasingly complex real-world applications*

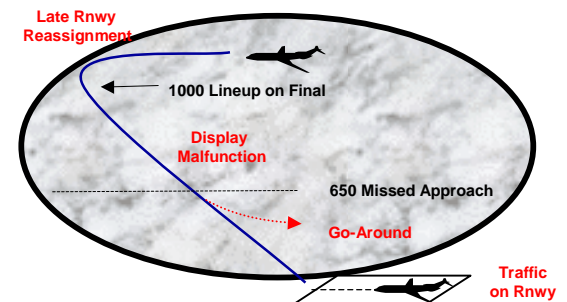
**'01 Modeling  
Taxi-Navigation Errors**



**'02-'03 Modeling  
Nominal Approach/Landing  
with and without SVS**



**'03-'04 Modeling  
Multiple Off-Nominal  
Approach/Landing with and  
without SVS**



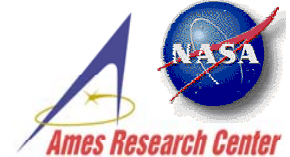




AvSP SWAP

# Taxi Navigation Modeling

Human Performance Modeling



## Data Set

T-NASA Full Mission Simulation

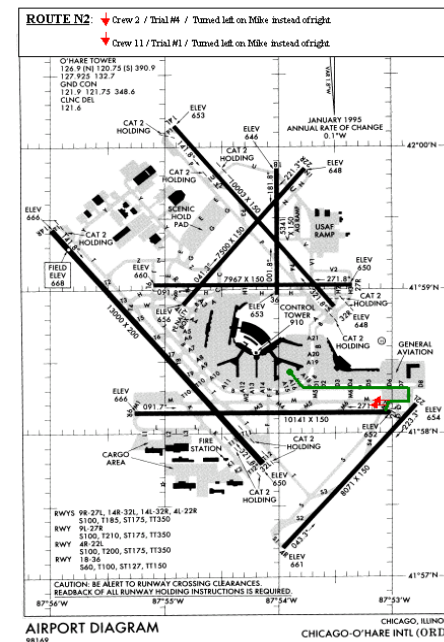
## Modeling Problem

Reproduce/Explain  
Taxiway Navigation Errors

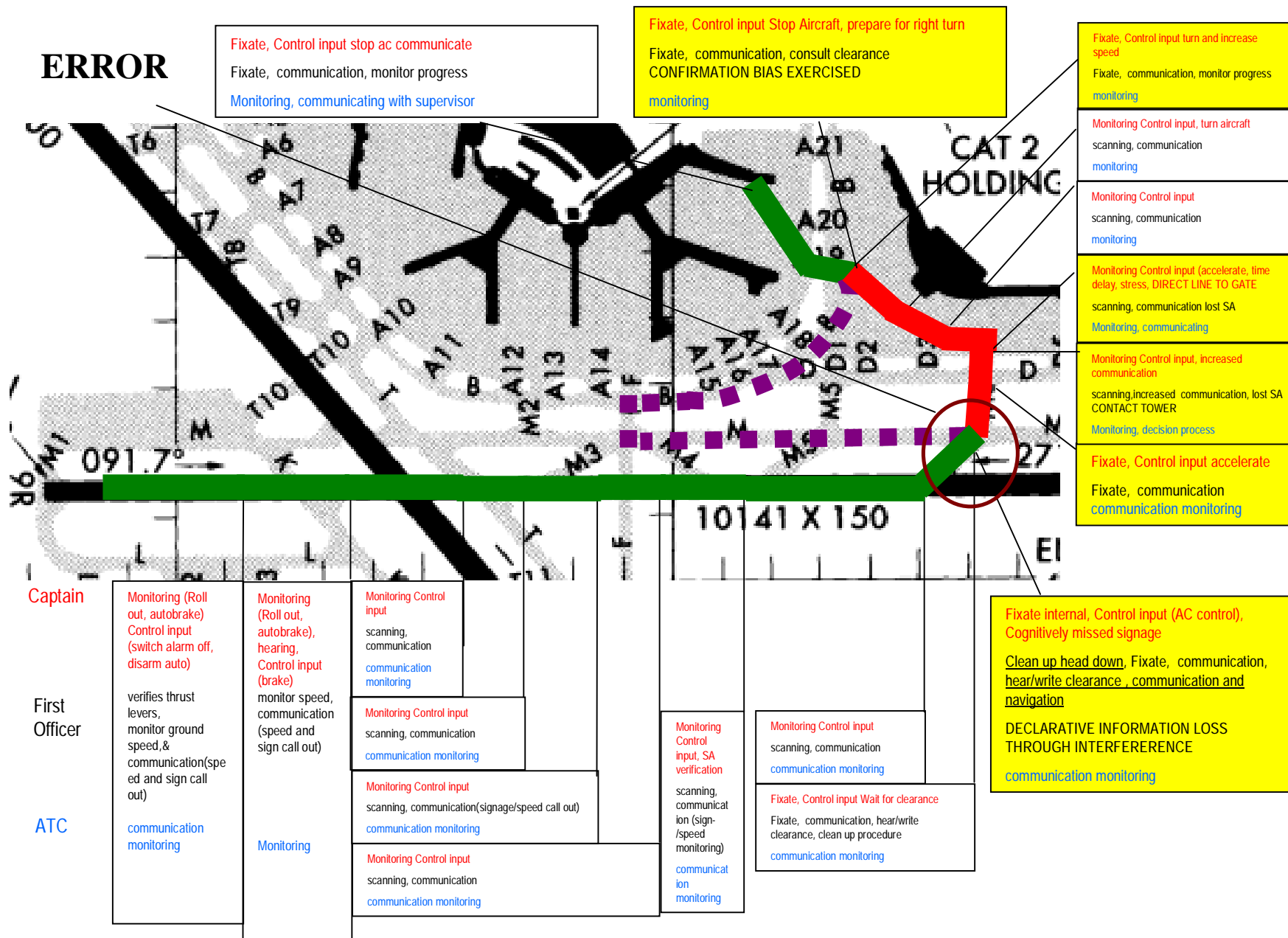


## Scenario Specifications

- High-fidelity full motion simulation of taxi-to-gate at Chicago-O'Hare
- 54 trials run by 18 airline crews
- 9 different cleared routes -- all in low visibility (1000 RVR)
- Traffic, hold short, and route changes included in scenarios
- 12 off-route errors committed by crews and specified to modelers



# Air MIDAS Simulation of Observed Error



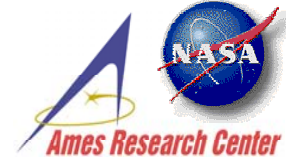




# Modeling Nominal Approach & Landing

AvSP SWAP

Human Performance Modeling



## Data Set

Part-task Pilot-in-loop Simulation  
Performance data and Eye-tracking (3 Subjects)

## Other Information Provided Modelers

Detailed Cognitive Task Analysis

## Modeling Problem

Develop "Normative" Model of Approach & Landing with and without Augmented Display



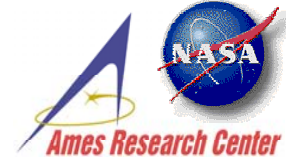
## Scenarios

Display Configuration		Baseline	Baseline	SVS
Visibility		VMC	IMC	IMC
	Nominal Approach (nominal landing)	<i>Scenario #1</i>	<i>Scenario #4</i>	<i>Scenario #7</i>
	Late Reassignment (side-step & land)	<i>Scenario #2</i>		<i>Scenario #8</i>
	Missed Approach (go-around)	<i>Scenario #3</i>	<i>Scenario #5</i>	<i>Scenario #9</i>
	Terrain Mismatch (go-around)		<i>Scenario #6</i>	<i>Scenario #10</i>

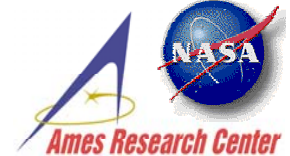


**AvSP SWAP**

**Human Performance Modeling**



QuickTime™ and a  
Cinepak decompressor  
are needed to see this picture.



# Implementation Plan Status

## '01 Modeling Taxi-Navigation Errors

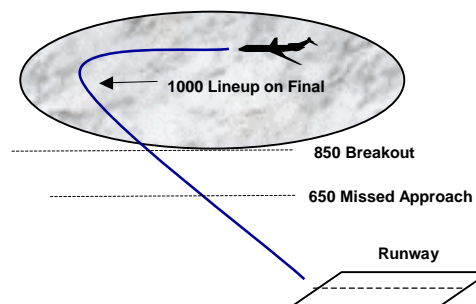
- Technical report on context of aviation errors
- Development of 5 models of surface operations
- Workshop 10/18/01



**Proof-of-Concept:** replication and causal explanation of various observed pilot taxi-navigation errors committed in high-fidelity simulation

## '02-'03 Modeling Nominal Approach/Landing with and without SVS

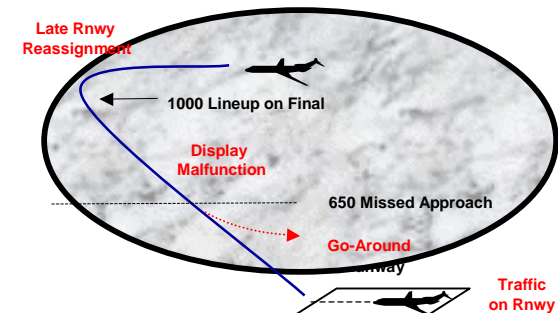
- Cognitive Task Analysis
  - Baseline approach & landing
  - Augmented display approach & landing
- Part-task Pilot-in-loop Simulation
  - Eye-tracking data
  - Display monitoring/ usage data
  - Multiple scenarios (late runway reassignment, system failure, etc.)
- Models of Approach / Landing
  - Initial model development
- Workshop scheduled 3/6/03
- Operator model provided to AvSP ASMM project



**Demonstrated:** 3 working models of pilot performance during nominal approach/landing: good correlations between simulation outputs and observed pilot eye tracking/visual attention allocation

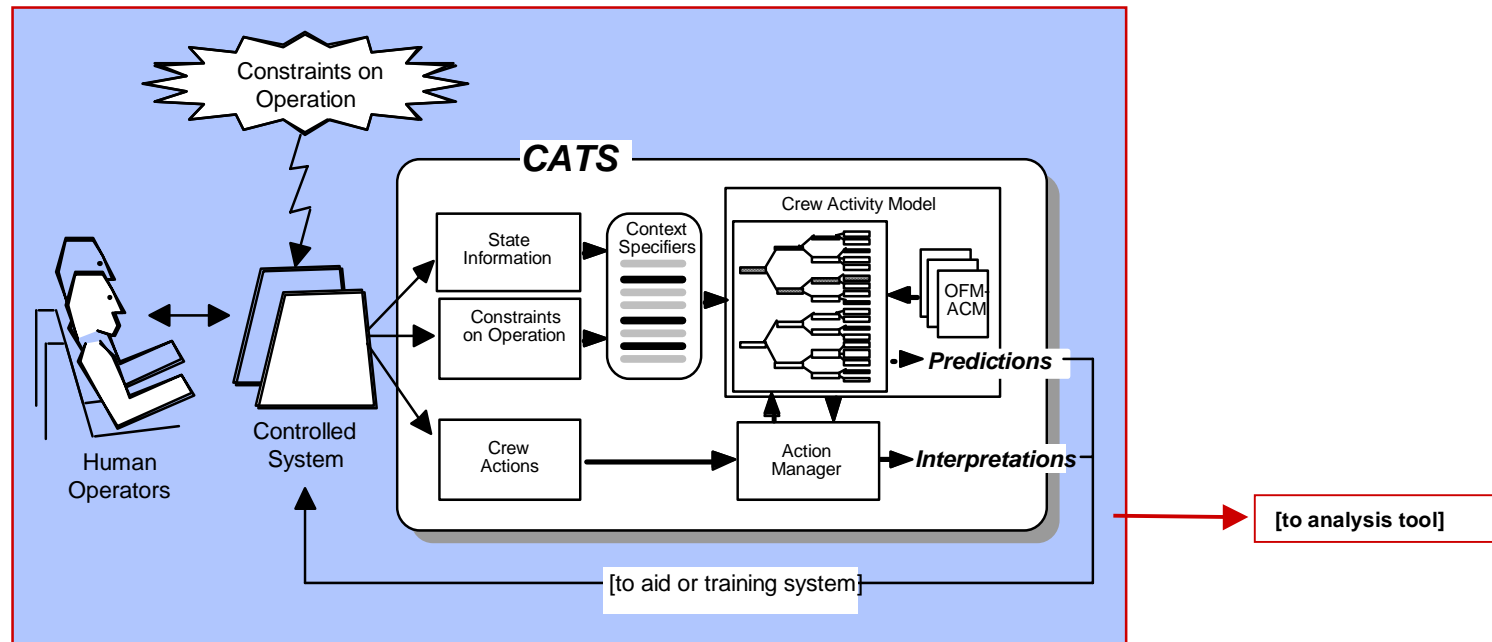
## '03-'04 Modeling Multiple Off-Nominal Approach/Landing with and without SVS

- Models of Approach / Landing
  - Develop advanced models
  - Investigate off-nominal scenarios
  - Identify error susceptibilities
  - Evaluate mitigation strategies
- Model Verification/Validation Approaches
  - Determine “choke points” (e.g., workload, SA at transition points)
  - Cross scenario
  - Cross model
  - Emergent behaviors



**Objective:** prediction of pilot attentional allocation, decisions, and actions during off-nominal operations with & without SVS

Computerized engineering model of correct task performance to predict operator activities and interpret operator actions



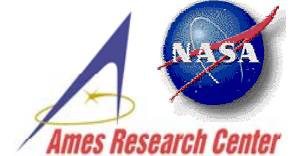
- Provides context-dependent knowledge about the operator's task that can support tutors, aids, and displays to enhance safety
- Supports visualization and analysis of human-automation interaction



# Detecting Errors from Flight Data

AvSP SWAP

Human Performance Modeling



**Current research demonstrates how CATS can analyze flight data from the Langley B757 ARIES aircraft to detect procedural errors**

*Callantine (2001a, 2001b)*



**NASA B757-ARIES**



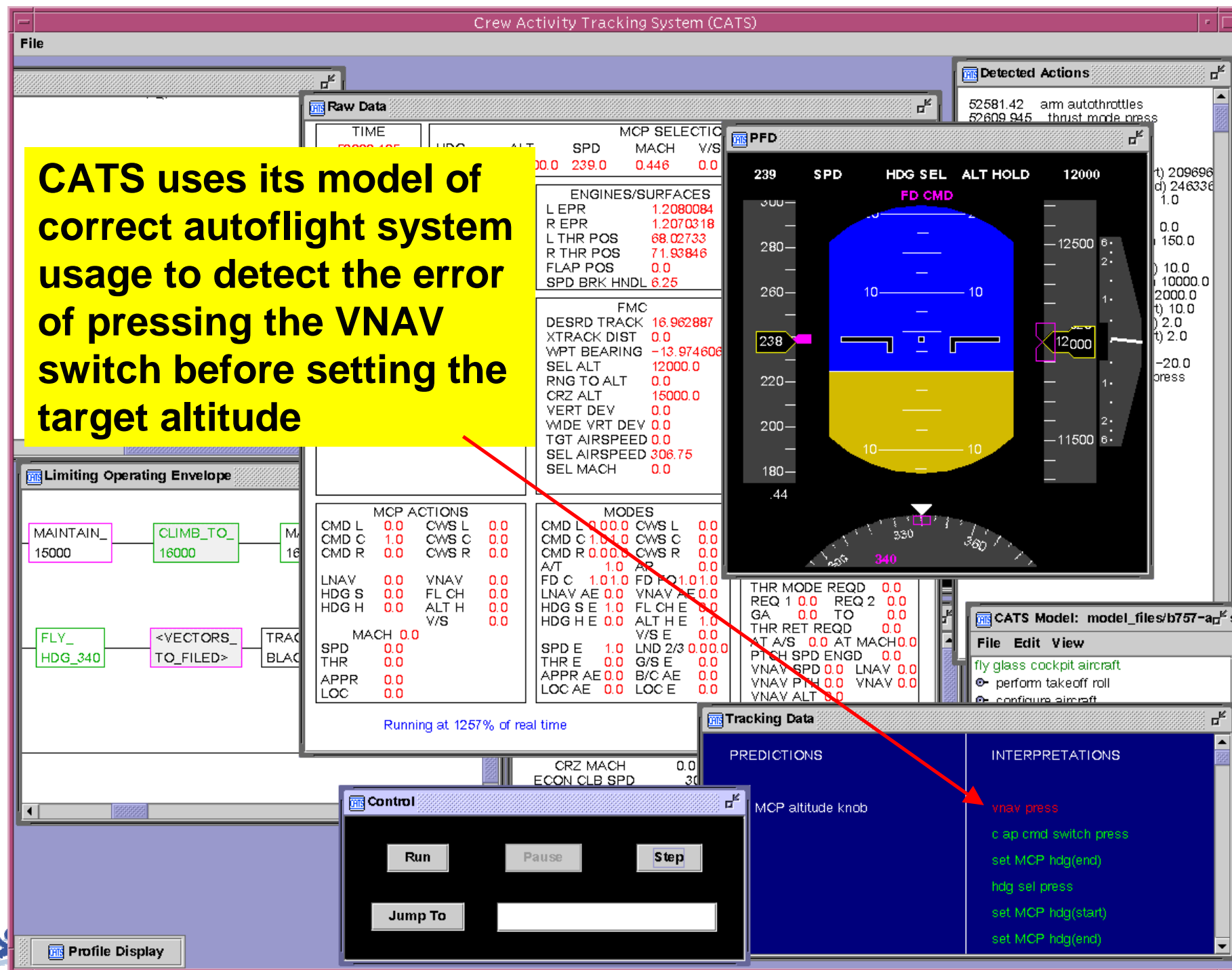
**On-board Data Acquisition System  
used to collect flight data**



**Cockpit observations verified  
and augmented digital data**





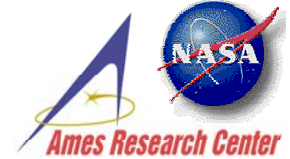




# Summary of CATS Development

AvSP SWAP

Human Performance Modeling



Demonstrated ability to detect pilot error from in-flight data

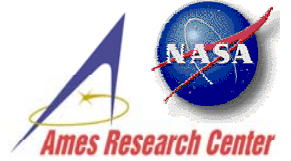
- Autoflight misuse in approach/landing operations
- Potential for onboard real-time error detection system

Developed CATS framework into autonomous agent model

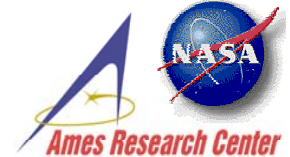
- Demonstrated agents that function as air traffic controllers capable of handling flow spacing problems in simulation
- Potential for stand-in for human air traffic controllers in large-scale simulations

Extend CATS agent-based models to incorporate error

- Developing process by which nominal agents will make *realistic* errors in fast-time simulation
- Potential to conduct "effects analysis" for a given scenario resulting from introduction of a particular error mechanism

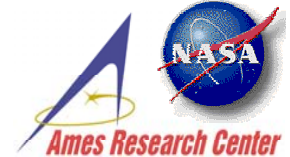


# Back-up Material



## **Journals, Books, Conference Proceedings**

- Callantine, T. (2002). A representation of air traffic control clearance constraints for intelligent agents. In A. El Kamel, K. Mellouli, and P. Bourne (Eds.), Proceedings of the 2002 IEEE International Conference on Systems, Man, and Cybernetics, #WA1C2, (CD-ROM).
- Callantine, T. (2002). Activity tracking for pilot error detection from flight data. Proceedings of the 21st European Annual Conference on Human Decision Making and Control, Glasgow, 16-26.
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- Gore, B.F., & Corker, K.M. (2001). Human error modeling predictions: Increasing occupational safety using human performance modeling tools. In B. Das, W. Karwowski, P. Modelo, and M. Mattila (eds.), Computer-Aided Ergonomics and Safety (CAES) 2001 Conference Proceedings, July 28 - August 4, Maui, Hawaii.
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## **Technical Reports**

- Byrne, M. D., & Kirlik, A. (2003). Integrated Modeling of Cognition and the Information Environment: A Closed-Loop, ACT-R Approach to Modeling Approach and Landing with and without Synthetic Vision System (SVS) Technology. Technical Report AHFD-03-4/NASA-03-3, Institute of Aviation. University of Illinois at Urbana-Champaign.
- Byrne, M. D., & Kirlik, A. (2002). Integrated Modeling of Cognition and the Information Environment: Closed-Loop, ACT-R Modeling of Aviation Taxi Errors and Performance. Technical Report AHFD-02-19/NASA-02-10, Institute of Aviation, University of Illinois at Urbana-Champaign.
- Callantine, T. (2002). CATS-based agents that err. NASA Contractor Report 2002-211858. Moffett Field, CA: NASA Ames Research Center.
- Callantine, T. (2002). CATS-based air traffic controller agents. NASA Contractor Report 2002-211856. Moffett Field, CA: NASA Ames Research Center.
- Callantine, T. (2002). Activity tracking for pilot error detection from flight data. NASA Contractor Report 2002-211406. Moffett Field, CA: NASA Ames Research Center.
- Corker, K.M., Gore, B.F., Guneratne, E., Jadhav, A., & Verma, S. (2003). SJSU/NASA coordination of Air MIDAS safety development human error modeling: NASA aviation safety program. Integration of Air MIDAS human visual model requirement and validation of human performance model for assessment of safety risk reduction through the implementation of SVS technologies, (Interim Report and Deliverable NASA Contract Task Order #: NCC2-1307), Moffett Field, CA.
- Deutsch, S., & Pew, R. (2003). Modeling the NASA baseline and SVS-equipped approach and landing scenarios in D-OMAR. BBN Report No. 8364. Contractor Report.
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- Keller, J. W., and Leiden, K. (2002). Information to Support the Human Performance Modeling of a B757 Flight Crew during Approach and Landing: RNAV. Contractor Report.
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- Leiden, K., Laughery, K.R., Keller, J. W., French, J.W., Warwick, W. and Wood, S.D. (2001). A Review of Human Performance Models for the Prediction of Human Error. Contractor Report.
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- Newman, R. L. (2002). Scenarios for "rare event" simulation and flight testing. Monterey Technologies Inc. / Crew Systems TR-02-07A.
- Uhlarik, J. and Prey, C.M. (2002). Functional Allocation Issues and Tradeoffs (FAIT) Analysis of Synthetic Vision Systems (SVS). Contractor Report.
- Wickens, C. D., McCarley, J. S. and Thomas, L. (2003). Attention-Situation Awareness (A-SA) Model, Contractor Report.



## **Upcoming**

- Byrne, M. D., & Kirlik, A. (in prep). Marrying cognitive and ecological analyses to support computational modeling of dynamic decision making in aviation. To appear in: A. Kirlik (Ed.), *Working with Technology in Mind: Brunswikian Resources for Cognitive Science & Engineering*. New York: Oxford University Press.
- Byrne, M. D., & Kirlik, A. (in prep). Integrating cognitive architectures and ecological analyses: Closing the loop. Manuscript to be submitted to *Cognitive Science*.
- Byrne, M. D., & Kirlik, A. (in prep). Modeling to support error diagnosis in commercial taxi operations. Manuscript to be submitted to *The International Journal of Aviation Psychology*.
- Corker, K., Gore, B.F., Jadhav, A., & Verma, S. (submitted 2003). Human-system modeling in flight deck synthetic vision systems: performance prediction and validation. Society of Automotive Engineers (SAE) World Aviation Congress, Aerospace Congress and Exposition, September 8-13, Montreal Canada (SAE Paper #:TBD).

## **Miscellaneous**

- Pew, R., & Deutsch, S. (2003). Modeling human error in an air traffic control environment. Contractor MIT Colloquium presentation.